⁷Trino for lakehouses, data oceans, and beyond

A project update for June 2023





By the numbers



- **16** releases since Trino Summit in Nov 2022
- **2,250** commits in 2023 so far (32,505 total)
- 660+ contributors
- 9,900+ Slack members
 - Go join and be #10,000!
- Over **20,000** known members in the community
 - From over **1,800** companies
- Continued rise on db-engines ranking
 - Climbed from 96th to 69th in one year



Continued growth > 8k



New maintainers



aws

- James Petty
 - Amazon Athena and EMR team
 - Deep and very wide experience as developer on Trino

- Manfred Moser
 - Starburst and Trino developer relations team
 - Trino: The Definitive Guide and documentation author
 - Trino Community Broadcast host

<u>https://trino.io/development/roles.html</u>





What's happened since Trino Summit 2022?





Table function improvements



• **exclude_columns** to simplify access for wide tables

sequence to generate number sequence

```
SELECT *
FROM TABLE(sequence(
    start => 1,
    stop => 1000,
    step => 10))
```

Table function improvements

 Pass-through with query/raw_query for more connectors, for example Elasticsearch

• **procedure** in SQL Server connector for stored procedure invocation



```
SELECT
  *
FROM
  TABLE(
    example.system.raw_query(
      schema => 'sales',
      index => 'orders',
      query => '{
        "query": {
          "match": {
            "name": "ALGERIA"
```

Fault-tolerant execution



- Simplified configuration
- Improved performance
- Support for exchange spooling on HDFS
- Support for MongoDB, BigQuery, Redshift, and Oracle connector

Ideal for your lakehouse migration and other ETL workloads!

Schema evolution, (meta)data, and tools



Enabling advanced lakehouse and related use cases:

- ALTER COLUMN ... SET DATA TYPE
- ALTER TABLE ... RENAME COLUMN added to connectors
- Nested fields in **DROP** COLUMN
- **\$timeline** system table in Hudi
- table_changes function and views in Delta Lake
- Support for REST, JDBC, and Nessie catalogs for metadata in Iceberg
- Lots of metadata tables in lceberg



Lakehouse migration - table procedures

• migrate to go from Hive to Iceberg

```
CALL example.system.migrate(
    schema_name => 'testdb',
    table_name => 'customer_orders')
```

register_table / unregister_table

```
CALL example.system.register_table(
    schema_name => 'testdb',
    table_name => 'customer_orders',
    table_location => 'hdfs://lake:9000/user/hive/warehouse/customer_orders-58
```

Tons of performance improvements



- Replaced Hive and Hadoop dependencies.
- Lower resource utilization when inserting into tables.
- Faster **INSERT** queries with fault-tolerant execution.
- Faster query planning with many **GROUP** BY clauses.
- Faster queries on large clusters with skewed queries.
- Faster comparison between date columns and timestamps.
- Faster parsing of date values.
- Faster queries with selective joins.
- Faster queries when predicates are null.
- Faster queries with joins on aggregations.
- Faster aggregations with **DISTINCT** clauses.
- Faster LIKE expressions with dynamic patterns.
- Faster queries with predicates with the **year** function.
- Reduced memory usage by the coordinator.

- Improved performance of table functions with table args.
- Lower latency for small queries with fault-tolerant execution.
- Faster queries with window operations or pattern recognition on small partitions.
- Faster **row_number** and **rank** functions.
- Faster results when queries return no values.
- Faster aggregations with variable file sizes.
- Faster INSERT, CREATE TABLE AS ... SELECT, and EXECUTE when table stats are wrong or missing.
- Faster queries with LIKE expressions that contain a %.
- Faster UNION ALL queries.
- Faster query planning for queries with joins.
- Faster **sum** aggregations.
- Faster **filter** function on arrays.

In case that wasn't enough...

Lakehouse Connectors

- Faster joins on partition columns.
- Faster reading and writing of Parquet files.
- Reduced memory usage when reading/writing Parquet files.
- Faster queries that read a small number of columns.
- Faster DROP TABLE.
- Faster queries with with filters or projections on low-cardinality string columns.
- Improved performance on tables created by Trino.
- Improved performance on tables written to by Trino.
- Improved performance when table statistics aren't available.
- Faster joins when both sides of a join have keys with the same definition.
- Faster planning for **SELECT** queries.



Lakehouse Connectors, cont.

- Faster planning for tables with large numbers of columns.
- Faster scans for **COUNT(*)** on row-oriented formats.
- Faster queries with selective filters on `row` columns.
- Faster joins on partition columns.

Other Connectors

- Support for Apache Arrow when reading from BigQuery.
- Faster queries when latency between Trino and the server is high in Oracle, PostgreSQL, and Redshift.
- Faster queries when selecting a small number of columns in Oracle, PostgreSQL, and Redshift.
- Faster queries with **sum(DISTINCT ...)** in JDBC connectors.

Tracing with OpenTelemetry



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Client tool news



- Heavy investment into the Python client
 - Various DB-API support improvements
 - Updated to support SQLAIchemy 2.0
 - **EXECUTE IMMEDIATE** and other performance improvements
 - Variable precision date/time and other improved type support
- dbt Cloud support available
- More to come from the Python ecosystem later today and tomorrow

Roadmap

- SQL 2023
 - JSON enhancements
 - Numeric literal usability enhancements
- json_table function
- Snowflake connector
- Java 21 soon
- Project Hummingbird



Trino: The Definitive Guide

- Second edition available
- Get a digital, English version <u>for free from Starburst</u>
- Polish edition now available
- Chinese edition coming soon

O'REILLY"

Trino Profesjonalny przewodnik

SQL w dowolnej skali, w dowolnym magazynie i w dowolnym środowisku







Trino The Definitive Guide

SQL at Any Scale, on Any Storage, in Any Environment



Matt Fuller, Manfred Moser & Martin Traverso



Getting involved



- Join community chat on Slack <u>https://trino.io/slack.html</u>
- Contribute code
 - <u>https://trino.io/development</u>
 - "good first issue" tag on github
- File issues and bugs at <u>https://github.com/trinodb/trino</u>
- Write blog posts and join us as guest on Trino Community Broadcast







Hudi



- `\$timeline` system table for tracking a table's timeline
- Improved performance from parallelized split generation and processing

Delta Lake



- Support for views
- Support for writing to the change data feed in Delta Lake
- Support for Databricks 12.2 LTS
- `unregister_table` procedure
- `table_changes` function

Iceberg



- Support REST, JDBC, and Nessie catalogs for metadata
- `unregister_table` procedure
- Support for sorted tables
- Better file pruning

The Iceberg connector work is making Trino a first-class query engine for Iceberg users.

Hive



- `migrate` procedure to convert a Hive table to lceberg
- Faster join queries over Hive bucketed tables.
- Faster planning for tables with many columns in Hive.

Slack updates



- Getting close to 10k users with average of 1000 active users per day
- Language channels to enable more users
 - general-de, general-ko, general-cn, general-jp
- Vendor channels to enable community partners and users
 - vendor-starburst, vendor-aws
- Ecosystem, tool, and technology channels as requested

Presentations and meetings



Help us spread the word about Trino!

- Ready made for you to use, and contribute more
 - <u>https://github.com/trinodb/presentations</u>
 - <u>https://trinodb.github.io/presentations/</u>
- Events calendar for your meetings and talks
- Support for community meetings such as Starburst 101 and Trino on Ice

Releases 405-420 highlights



[Trino 405]({{site.url}}/docs/current/release/release-405.html)

- * Support for `ALTER COLUMN ... SET DATA TYPE` statement.
- * Support for Apache Arrow when reading from BigQuery.
- * Support for views in the Delta Lake connector.
- * Support for the Iceberg REST catalog.
- * Support for Protobuf encoding in the Kafka connector.
- * Support for fault-tolerant execution in the MongoDB connector.
- * Support for `DELETE` and query pushdown in the Redshift connector.
- * Performance improvements when reading Parquet data.

[Trino 406] {{ site.url }}/docs/current/release/release-406.html)

- * Support for JDBC catalog in the Iceberg connector.
- * Support for fault-tolerant execution in the BigQuery connector.
- * Support for exchange spooling on HDFS.
- * Support for `CHECK` constraints with `INSERT` statements.
- * Improved performance for Parquet files with the Delta Lake, Hive, Hudi and

Iceberg connectors.

Performance improvements



Incremental improvements to connector performance and core performance are part of every release. A few highlights:

- Faster aggregations containing **DISTINCT**
- Faster LIKE with dynamic patterns
- Improved performance of queries involving window functions or MATCH RECOGNIZE
- Faster UNION ALL queries
- Faster sum (`DISTINCT ...`) queries for various connectors

Lakehouse performance improvements



- Replaced Hive and Hadoop dependencies.
- Faster Parquet data processing.
 - *Many* incremental performance improvements.
- Faster reads of nested row fields in Delta Lake connector.
- Faster joins on partition columns in lakehouse connectors.